

1 Article

2 Evaluation of an Educational Videogame on 3 Mathematics Achievement in First Grade Students

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14 **Abstract:** Development of early math skills is linked to future success in
15 mathematics and other academics. Educational videogames have been shown to
16 promote academic achievement; however, few rigorous studies have evaluated the
17 use of educational videogames in supporting math development, especially in
18 early primary education. In the current study, an open-label randomized controlled
19 trial was conducted involving 134 first grade students to determine, using
20 standardized assessments, the impact of the educational mathematics tablet-based
21 videogame, *Knowledge Battle*, on math scores and self-competency. Overall,
22 *Knowledge Battle* did improve math skills in participants who played the game.
23 Among those with lower pre-game math skills, the *Knowledge Battle* group's mean
24 math score increased more than the control group's mean math score (9.7 vs. 6.0;
25 $p=0.02$). There was no association between perceived sense of self-competency and
26 total math score ($p=0.8141$). However, players who had a higher sense of self-
27 competency were more likely to enjoy playing the game. In conclusion, our
28 findings suggest that *Knowledge Battle* was an acceptable and enjoyable educational
29 mathematical videogame for first grade students, and may be most impactful for
30 those with low math skills.

31 **Keywords:** mathematics; videogame; education; self-competency; randomized
32 controlled trial

33

34 1. Introduction

35 Development of early academic skills is essential for children's' later success in
36 school. In particular, research suggests that early mathematics skills are the most
37 important predictors not only for later math achievement but also for achievement
38 in other content areas and grade retention[1]. General math achievement measured
39 around kindergarten entry has been found to be highly predictive of subsequent

40 mathematics achievement, measured around the time of third grade[2, 3].
41 Additionally, those children who score highly in mathematics in kindergarten
42 continue to score highly, while those who score low continue to score low
43 throughout their educational careers[1, 4, 5]. Mathematics scores in the United
44 States have barely moved in the last 30 years[6], and the Common Core State
45 Standards Initiative[7] has been trying to address this problem.

46 Educational videogames are thought to be effective tools for teaching because
47 they (a) use action instead of explanation, (b) create personal motivation and
48 satisfaction, (c) accommodate multiple learning styles and skills, (d) reinforce
49 mastery skills, and (e) provide interactive and decision making context[8, 9]. In
50 addition, there is evidence that educational videogames promote student learning
51 of important skills, positive motivation, persistence, curiosity, attention and
52 attitude toward learning[10-13]. A meta-analysis that examined 39 studies
53 published between 1990 and 2012 reporting on the use of videogames in an
54 educational context showed that videogame-based approaches were significantly
55 more effective than typical instructional methods in improving learning[14].

56 Educational videogames have been used to promote children's mathematics
57 achievement in various domains including problem-solving and algebra skills[15],
58 strategic and reasoning abilities[16], geometry skills[17], and arithmetic
59 procedures[18]. However, there are a limited number of rigorous studies exploring
60 the effects of the use of videogames on mathematic skills development and
61 empirical findings on the effects of educational videogame use on student
62 achievement are inconsistent[19]. To date, only a few studies have evaluated the
63 use of educational videogames in supporting math development in early primary
64 education[20-22].

65 The primary purpose of this study was to determine if the educational
66 videogame, *Knowledge Battle*, compared to a series of control games, increased
67 math scores in first grade students. The secondary objective was to determine if
68 *Knowledge Battle*, compared to a series of control games, increased math self-
69 competence in students. In addition, data was collected on participants' gameplay
70 satisfaction and experience of playing *Knowledge Battle*.

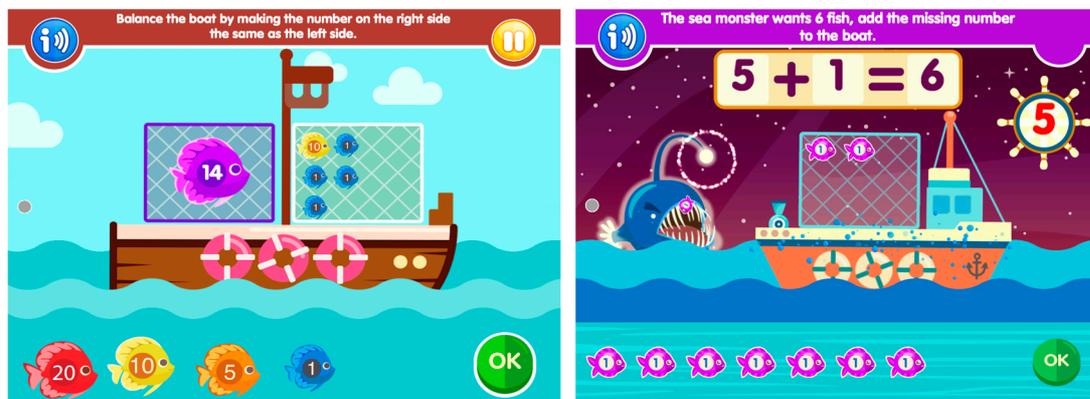
71 2. Materials and Methods

72 To determine the impact of the educational math videogame, *Knowledge Battle*,
73 gameplay on math scores and self-competency standardized assessments, we
74 conducted an open-label randomized controlled trial with a cohort of first grade
75 students.

76 2.1 Educational Videogame Description

77 *Knowledge Battle* is a tablet-based educational math videogame designed and
78 developed by the educational mobile game company, Yogome, Inc. Designed for
79 first grade students, *Knowledge Battle* consists of 21 mini-games nestled inside a

80 larger battle-style game with the goal of encouraging the player to exercise and
81 master skills that are built upon Common Core Standards for Mathematics[7]
82 (Figure 1). In the game, the player is able to take on the role of one of eight *Yogotar*
83 characters, each of whom has strengths and weaknesses. As their chosen character,
84 the player must master each mini-game through practice and repetitive play in
85 order to advance in the game, with the added bonus of earning *Power Cubes* along
86 the way. *Power cubes* strengthen the player's *Yogotar* and allow them to battle
87 increasingly stronger enemy characters as a reward for successfully completing
88 mini-game levels. *Knowledge Battle* scaffolds the player by providing immediate
89 feedback and explanation for incorrect responses. Once a particular mathematic
90 skill has been mastered, a new mini-game (or new level within previously
91 mastered mini-game) is unlocked for the player. To increase player engagement,
92 *Yogotar* characters and storylines are incorporated into the overall gameplay.



93
94 **Figure 1.** Examples of mini-games from the educational math videogame, *Knowledge Battle*.

95 2.1 Participants

96 Eligible participants were boys and girls enrolled in the first grade and were
97 recruited from several school and community-based after-school programs.

98 2.2 Instruments

99 2.2.1. KeyMath-3 Diagnostic Assessment

100 Mathematics skills were assessed using the KeyMath-3 Diagnostic Assessment
101 (KeyMath – 3 DA), a comprehensive norm-referenced measure of essential
102 mathematical concepts and skills[23]. The KeyMath-3 DA item content reflects the
103 content and process standards described in the National Council of Teachers of
104 Mathematics (NCTM) *Principles and Standards for School Mathematics*, a widely used
105 publication that outlines the essential components of a school mathematics
106 program. The standardized assessment contains two parallel forms (Form A and
107 Form B) that were developed concurrently and are matched statistically and by
108 content to reduce item familiarity and allow for a reliable measure of a student's
109 progress over time. The KeyMath-3DA includes 10 subtests that represent three
110 general math content areas: Basic Concepts (conceptual knowledge), Operations

111 (computational skills), and Applications (problem solving) and can be used with
112 individuals aged 4 years 6 months through 21 years. The Key Math 3-DA uses
113 basal and ceiling rules and start points, which allows for an accurate measure of an
114 individual's math performance. The standardized assessment is administered and
115 scored according to uniform procedures to allow for direct comparison of a
116 student's results to other students of the same grade level or age and has been
117 accepted as an appropriate instrument to assess students' general mathematical
118 ability, especially strengths and weaknesses in different mathematics content
119 areas[24]. For the purpose of this research study, we collected data using the
120 following six relevant and developmentally appropriate subsets:

121 ***Numeration:** early number awareness; place value and number sense; magnitude of*
122 *numbers; fractions; decimals; percentages; exponents; integers; multiples; and factors*

123 ***Measurement:** early awareness of measurement; standard units, time, money*

124 ***Data Analysis and Probability:** early awareness of data and probability; charts*
125 *tables, and graphs; graphical representation; statistics; probability*

126 ***Mental Computation and Estimation:** Early awareness of mental computation;*
127 *mental computation chains, mental computation with whole numbers; mental*
128 *computation with whole numbers; estimation and whole numbers; estimation and*
129 *rational numbers*

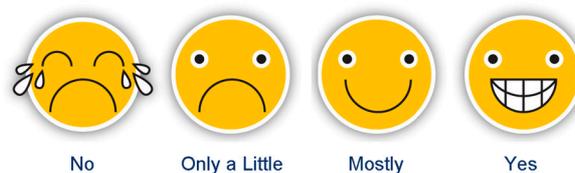
130 ***Addition and Subtraction:** algorithms to add and subtract whole numbers;*
131 *algorithms to add and subtract rational numbers, integers, algebra*

132 ***Foundations of Problem Solving:** analysis of problems; word problems, problem-*
133 *solving strategies*

134 2.2.2. Perceived Math Competence Scale

135 Math self-competence was assessed using a six-question, four-point "structure
136 alternate format" likert scale survey designed for young children adapted from the
137 28-item Perceived Competence Scale in Children[25]. We defined self-competence
138 as "a child's sense of cognitive competence." Each item was scored from one to
139 four using smiley-faces to represent responses of *no*, *only a little*, *mostly*, and *yes*
140 (Figure 2). Examples of questions included, "Can you figure out math problems on
141 your own?" and "Are you good at learning new things in math?"

6. Are you good at learning new things in math?



142

143

Figure 2. Example of a question from the *Perceived Math Competence Scale*.

144 2.2.3. Gameplay Satisfaction and Player Experience

145 Gameplay satisfaction and player experience was assessed using a six-
146 question, four-point likert scale survey developed by the research team, which
147 included corresponding smiley-faces to represent possible responses, included *no*,
148 *only a little*, *mostly* and *yes*. Examples of questions from the survey included, “Did
149 you enjoy playing Knowledge Battle?” and “Did you learn new things from
150 playing Knowledge Battle?”

151 2.3 Procedure

152 The Yale School of Medicine Human Investigation Committee approved the
153 research. Research and after-school program staff discussed the study with
154 interested parents and children and screened for eligibility. If the child was eligible
155 and interested, informed written consent was obtained from the parents.
156 Demographic information and baseline measures of math skills and math self-
157 competency were collected in a one-on-one interview with the child and a research
158 staff member. Participants then played *Knowledge Battle* on an iPad for one hour,
159 two to three times per week for four weeks to accumulate 8-10 hours of gameplay.
160 Measures of math skills and math self-competency data were collected again
161 immediately at the end of the gameplay sessions (approximately four weeks after
162 baseline). For the experimental group, data on gameplay satisfaction was collected.

163 2.4 Data Analysis

164 Baseline descriptive statistics (means (sd); median (interquartile range) and
165 proportions/number/percent) were tabulated. Total scores as well as sub-scores
166 from the study assessment tools were used for comparisons among groups, using
167 using parametric (t-test; ANOVA) or non-parametric (Wilcoxon Rank Sum;
168 Kruskal-Wallis) as deemed appropriate. Two-tailed alpha level of 0.05 was used to
169 declare statistical significance. Analysis was carried out using SAS v 9.3, SAS
170 Institute Inc. Cary, NC., USA.

171 Baseline assessments stratified the participants into two groups based on the
172 median score of the cohort, those with more pre-game math knowledge (n=67) and
173 those with less pre-game math knowledge (n=67).

174 3. Results

175 Participants were 134 first grade students (49% boys) with a mean age of 6.6
 176 years. Seventy-two (54%) participants were black, 33 (25%) were white, 10 (8%)
 177 were Asian, 11 (8%) were other races, and the race of 8 (6%) was unknown.
 178 Twenty-nine (22%) were Hispanic, 98 (73%) were non-Hispanic, and 7 (5%) were
 179 reported as unknown.

180 All participants played approximately 8 sessions over a four-week period. The
 181 *Knowledge Battle* group played a mean of 395 minutes (6.6 hours) with a range of
 182 96-800 minutes; 1.6-13.3 hours). The control group played a mean of 398 minutes
 183 (6.6 hours) with a range of 120-700 minutes; 2.0-11.7 hours).

184 3.1 KeyMath-3 Diagnostic Assessment Scores

185 3.1.1. All players

186 Among all players, there were no statistically significant differences in any of
 187 the baseline scores. After gameplay, the *Knowledge Battle* group's mean math score
 188 increased more than the control group's mean math score (7.4 vs. 5.9; $p=0.22$) but
 189 this change was not statistically significant (Table 1).

190 Table 1. Mean math scores for experimental and control groups.

GROUP	N	Mean	Std Dev	Std Err	Minimum	Maximum
Control	67	5.8955	5.7922	0.7076	-17.0000	23.0000
YoGoMe	66	7.3788	7.9358	0.9768	-17.0000	36.0000
Diff (1-2)		-1.4833	6.9391	1.2034		

191

192 For the Numeration sub-score, after gameplay, the *Knowledge Battle* group's
 193 mean Numeration sub-score increased more than the control group's mean
 194 Numeration sub-score (2.3 vs. 1.5; $p=0.049$). For all other sub-scores, there was not
 195 a statistically significant change in mean math scores.

196 3.1.2. Players with lower pre-game math skills

197 For the group with lower pre-game math skills there were no statistically
 198 significant differences in any of the baseline scores. Among those with lower pre-
 199 game math skills, the *Knowledge Battle* group's mean math score increased more
 200 than the control group's mean math score (9.7 vs. 6.0; $p=0.02$).

201 For the Numeration sub-score, after gameplay, the *Knowledge Battle* group's
 202 mean Numeration sub-score increased more than the control group's mean
 203 Numeration sub-score (2.8 vs. 1.3; $p=0.008$). For all other sub-scores, there was not
 204 a statistically significant change in mean math scores.

205 3.1.3. Perceived Math Competence Scores

206 Analysis of data from all players indicated that there was no association
207 between perceived sense of self-competency and total math score ($p=0.8141$).

208 For participants who played *Knowledge Battle*, there was evidence of differences
209 in the mean post-pre game change in total self-competency score by responses to
210 two gameplay satisfaction questions, "Would you tell your friends to play
211 *Knowledge Battle*? ($p=.0295$) and "Did you enjoy playing *Knowledge Battle*?",
212 there was a strong association, though not significant ($p=.0624$). In both cases, those
213 who responded 'Yes/Mostly' for these two questions had a higher change in score.

214 3.1.4. Gameplay Satisfaction and Player Experience

215 Post-gameplay satisfaction data was collected from 65 (98%) participants who
216 played the *Knowledge Battle* game. Of these participants, 83% reported that they
217 enjoyed playing the game; 72% reported they would play it again; 82% reported
218 they liked the way it looked; 62% reported that they liked the *Yogotar* characters in
219 the game; 71% reported that they would tell their friends to play it; and 74%
220 reported that they learned new things from playing the game.

221 There was evidence to suggest that performance level was not independent of
222 gameplay satisfaction. There was an association between better performance and
223 gameplay satisfaction as assessed by the questions, "Did you like the characters
224 (*Yogotars*) in *Knowledge Battle*?" ($p=.0501$), and "Did you learn new things from
225 playing *Knowledge Battle*?" ($p=.0525$). Similarly, for participants who played
226 *Knowledge Battle*, those who responded "Yes/Mostly" to the question "Did you like
227 the characters (*Yogotars*) in *Knowledge Battle*?" had a higher change (post-pre game)
228 in total math score than participants who responded "No/Only a little" ($p = .0539$).

229 4. Discussion

230 Overall, *Knowledge Battle* did improve math skills in participants that played
231 the game. Specifically, there was a difference between the *Knowledge Battle* and
232 control groups' Numeration sub-test mean scores. This finding is important, given
233 that the Numeration sub-test measures the most instructionally important math
234 concepts and skills in the early elementary mathematics curricula. A child's
235 understanding of the concepts introduced in the Numeration subtest serves as a
236 foundation for important math concepts involving estimation and computation,
237 measurement, data interpretation, and problem solving[23], which are addressed
238 throughout the *Knowledge Battle* game.

239 Another important finding in this study was that among participants with less
240 pre-game math skills, the *Knowledge Battle* group's mean overall math score
241 increased more than the control group's mean math. Consistent with prior
242 literature that suggests that educational videogames are most effective for children

243 who start out with relatively poor skills[26], our findings indicate that participants
244 with a lower level of first-grade math skills may have benefited the most from
245 playing *Knowledge Battle*, with a specific focus on increased first-grade math skills
246 related to the Numeration subtest.

247 While mathematics is often viewed as a difficult and tedious subject to
248 learn[27], students' confidence or sense of self-competence of their math ability has
249 been shown to greatly influence performance and academic achievement in
250 mathematics[28]. In contrast, in our study, participants' sense of math self-
251 competency was not associated with their total overall math score. This may be
252 important to consider for future development of math games, especially for those
253 that are uniquely tailored to a child's skill level. Even if a child has a high math
254 skill level for their age or grade level, their perception of their sense of self-
255 competency in math may in fact be low. Therefore, games should consider
256 providing reward systems such as points or badges equally across all skill levels
257 and not just to players that may need more support. Well-designed tools that not
258 only optimize learning but also serve to increase self-competence in mathematics
259 are important for all skill levels.

260 The majority of participants assigned to the experimental group were very
261 positive about *Knowledge Battle*. Those participants who liked the characters,
262 compared with those who did not, had a greater change in their math scores. This
263 finding suggests including likable characters in a game like *Knowledge Battle* may
264 help to increase the player's engagement. Players who had a higher sense of self-
265 competency were more likely to enjoy playing the game, suggesting that players
266 with greater confidence in their ability to succeed in math may find a greater
267 interest in mathematics overall, which was reflected in their enjoyment of playing
268 the game.

269 There were several limitations to this study. First, this study was conducted in
270 after-school programs and findings from this study may not be generalizable to
271 other regions of the country or within other organizational settings. Second,
272 because the videogame was developed based on Common Core Mathematics
273 Standards for first grade students, participants with a higher level of pre-game
274 math skills at the start of the program may have reached a ceiling in their ability to
275 learn new skills, thus preventing the videogame from having an effect on their
276 math scores at the end of the study. In turn, participants with a lower level of pre-
277 game math skills at the start of the program may have benefited more from playing
278 at a Kindergarten or lower level in the game. Finally, students could have been
279 learning new math content in their classroom while the project was ongoing.
280 Although this could impact our findings, we made efforts to ensure that all
281 students in each after-school program were exposed to a similar level of math

282

283 5. Conclusions

284 In summary, *Knowledge Battle* is both an acceptable and enjoyable game-based
285 math program with a high potential for repeated and continued gameplay. It had
286 the greatest impact on students with lower math skills and may be most appealing
287 to players that have a high sense of math self-competency.

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290 the experiments; K.H., T.K. and L.F. analyzed the data; all authors contributed to the writing of the paper.

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292 of the study; in the collection, analyses, or interpretation of data; in the writing of the manuscript, and in the
293 decision to publish the results.

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